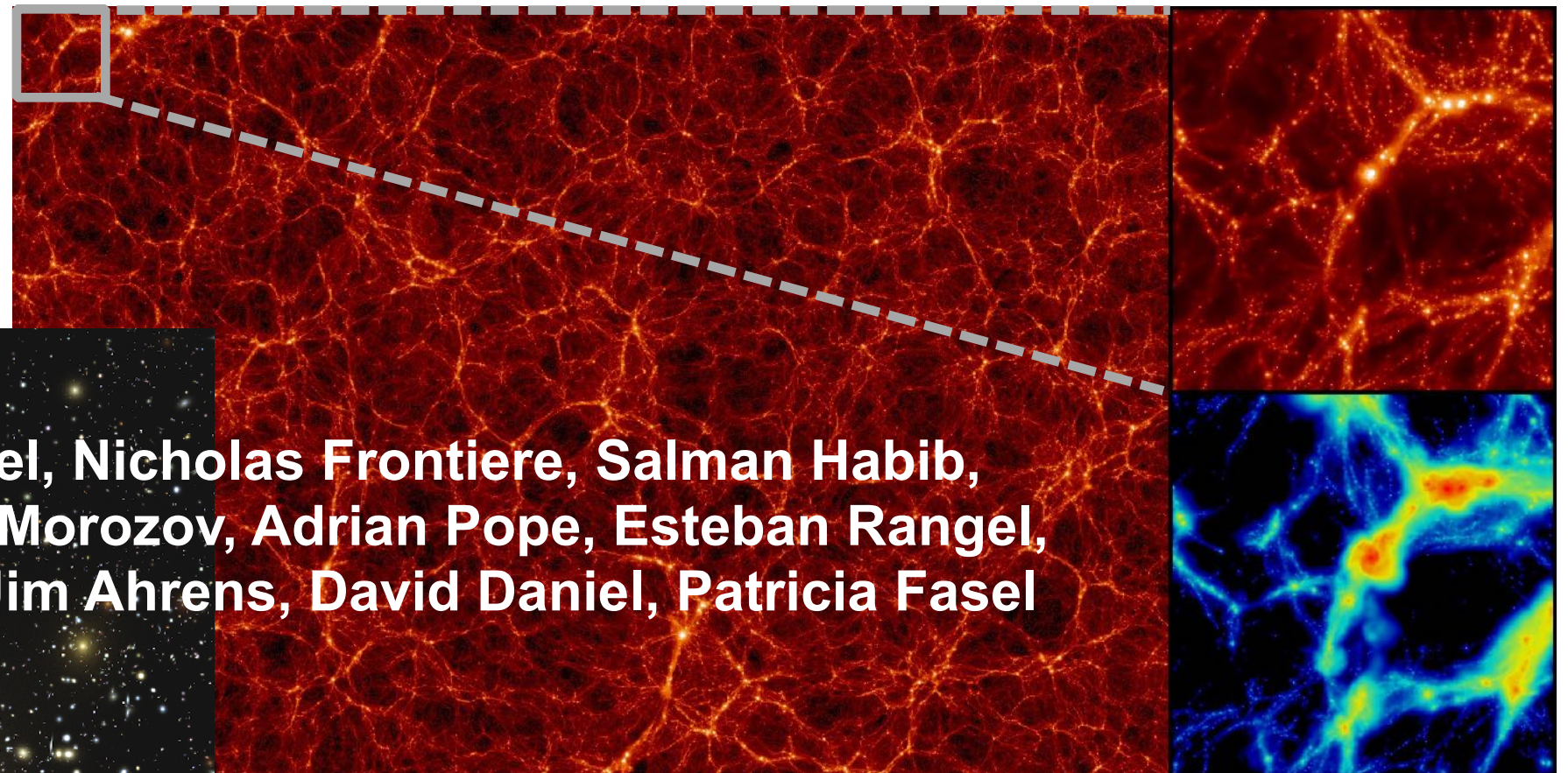


# Marching to Exascale: Extreme-Scale Cosmological Simulations with HACC\* on Summit



JD Emberson, Hal Finkel, Nicholas Frontiere, Salman Habib,  
Katrin Heitmann, Vitali Morozov, Adrian Pope, Esteban Rangel,  
Tom Uram (Argonne); Jim Ahrens, David Daniel, Patricia Fasel  
(LANL)

**Salman Habib**

**Argonne National Laboratory**

**2019 OLCF User Meeting**

**May 21, 2019**

**\*Hardware/Hybrid Accelerated Cosmology Code**



# A Little Personal History —

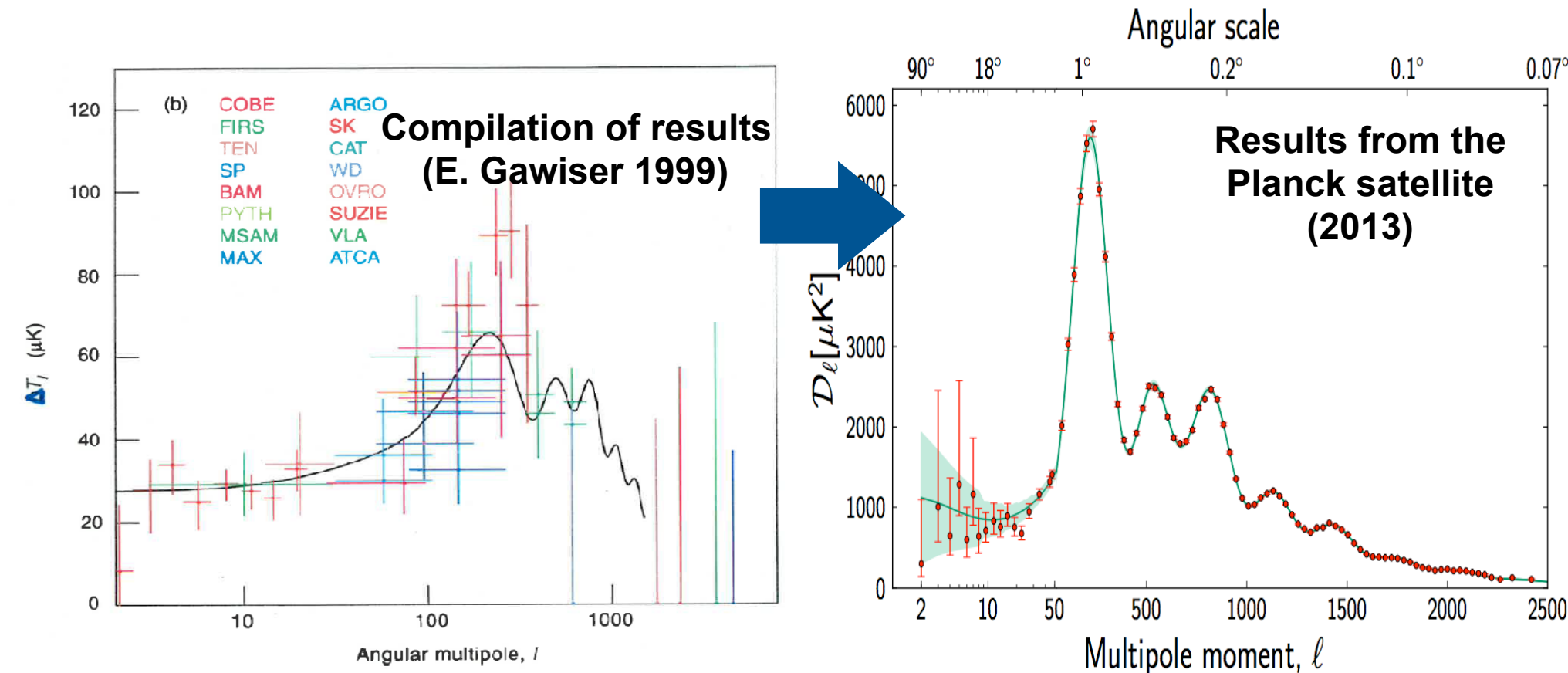
- **Supercomputer Evolution:** Supercomputing has come a very long way since summer 1993 when the CM-5 was #1 —
  - 1024 nodes, 131 GFlops (peak)! (131 kW)
  - Total RAM, 32 GB!
  - Could barely do  $512^3$  simulations
  - But it was easy and fun to program!
- **Summit is a world apart:** No more 1-2 people codes, now have end-to-end simulations, etc.
  - Focus on code architecture and algorithms
  - Complex science problems
  - Effective teaming essential
  - System-scale modeling/simulation
  - Still fun (in a way) —

Cabinet design:  
Maya Lin

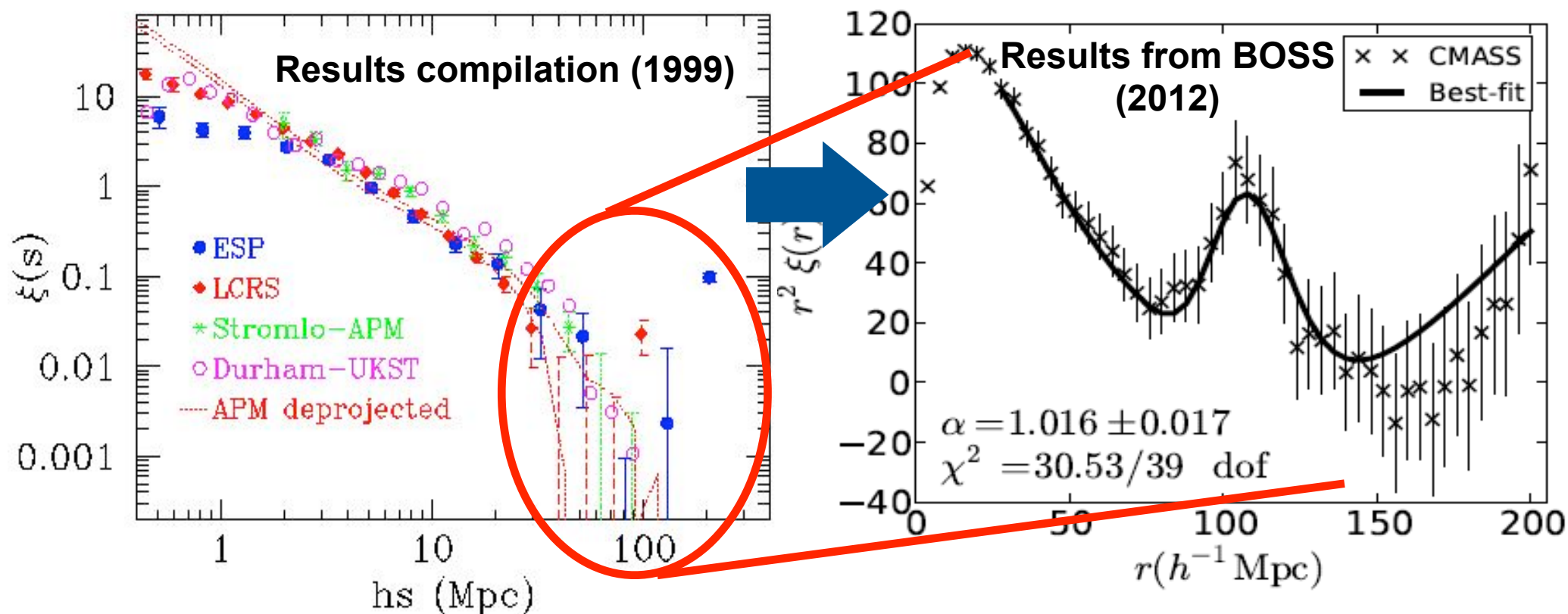
Thinking Machines CM-5  
at Los Alamos National  
Laboratory

Summit

# HACC Science Drivers: Cosmological Surveys



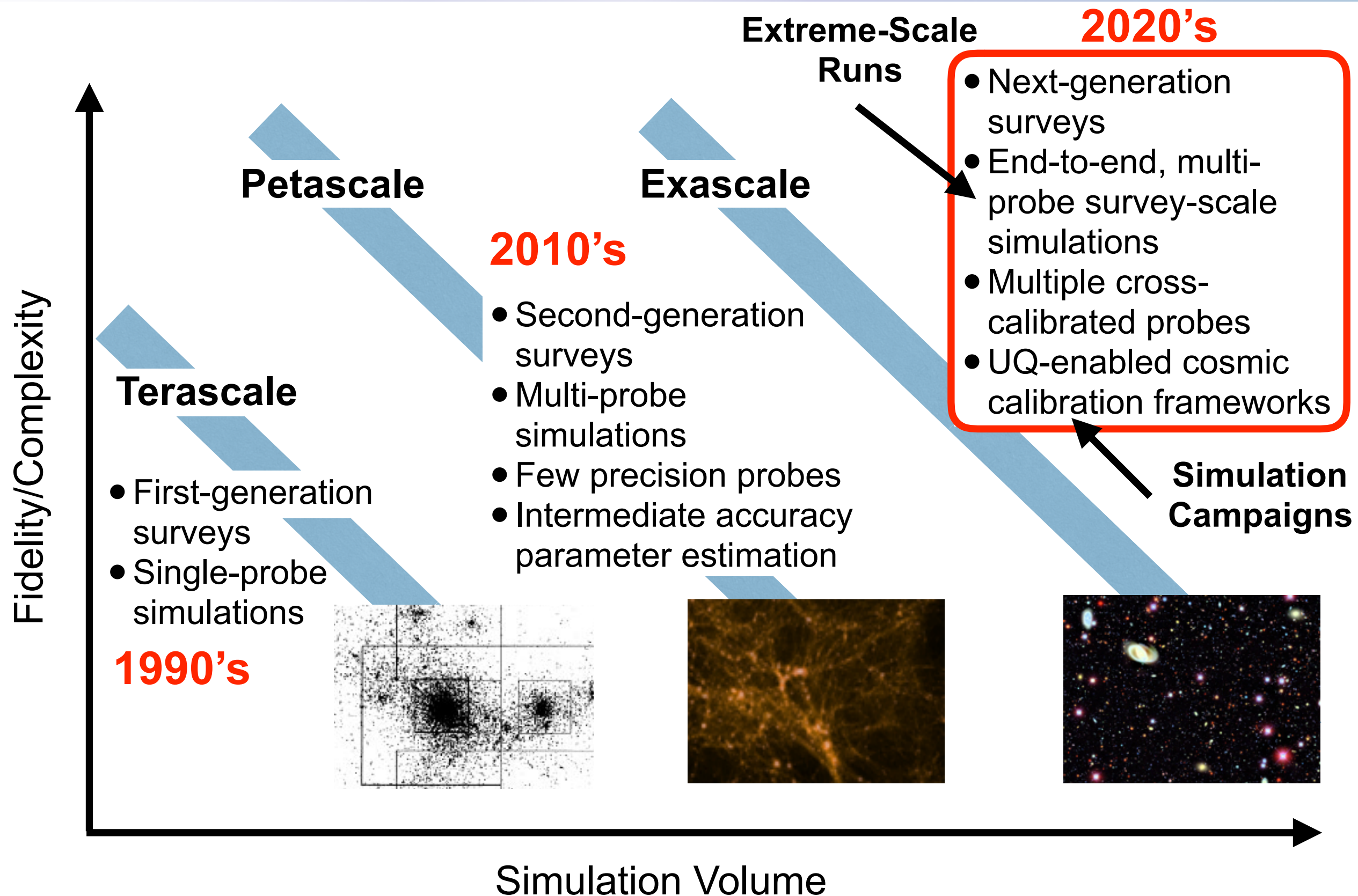
- Massive increase in sensitivity of cosmic microwave background (CMB) observations
- Cross-correlation with galaxy surveys
- New era of CMB modeling/simulations



- Massive increase in volume of galaxy surveys
- Next-generation galaxy clustering simulations
- Multi-physics codes needed to meet accuracy requirements



# Cosmology: Simulation Frontiers





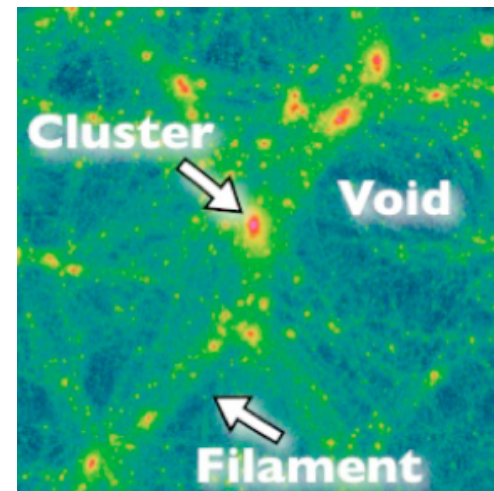
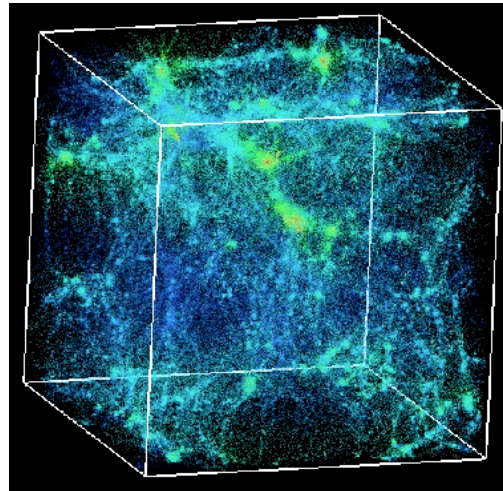
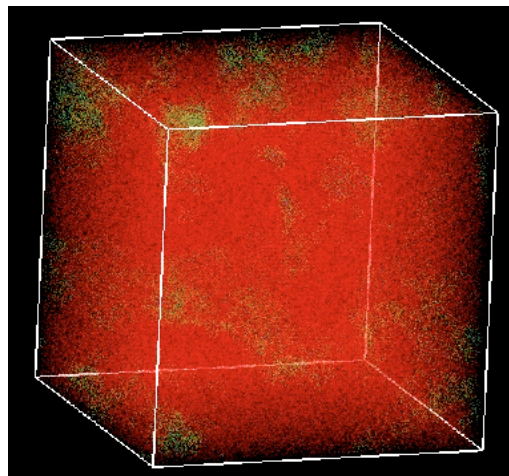
# End-To-End Workflow Complexity

Gaussian Random  
Field Initial Conditions

High-Resolution  
N-Body (+ Hydro)  
simulations

Multiple Outputs  
Halo/Sub-Halo  
Identification

Halo Merger Trees



**HACC**

Semi-Analytic +  
Empirical Galaxy  
Modeling

Galaxy Catalog

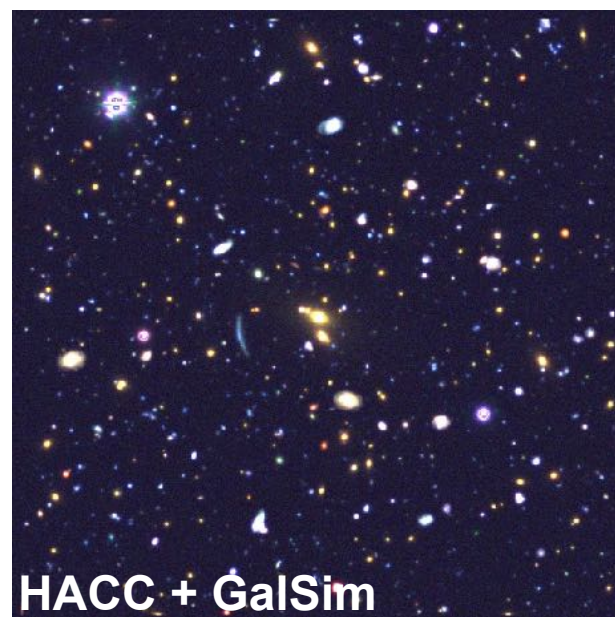
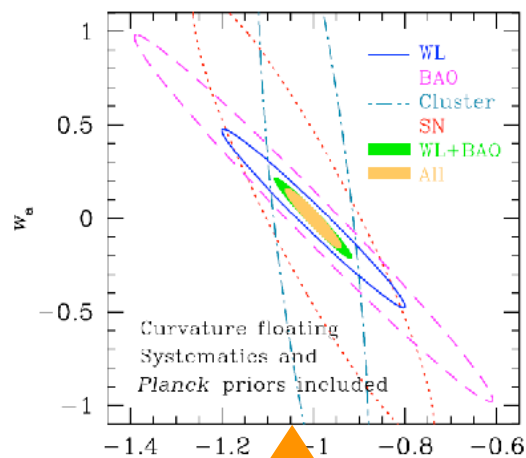
Realistic Image  
Catalog

Atmosphere and  
Instrument Modeling

Data Management  
Pipeline

Data Analysis Pipeline

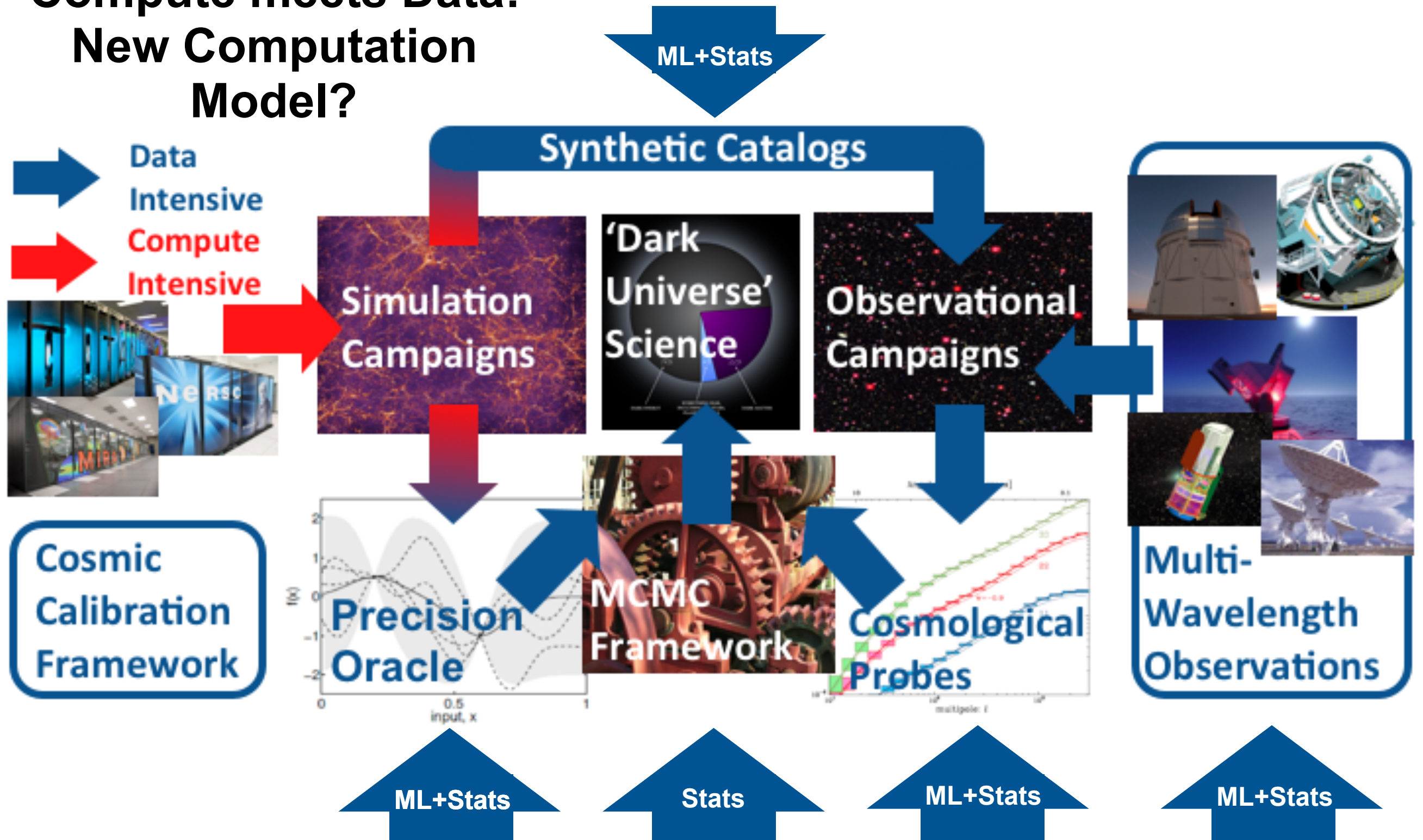
Scientific Inference  
Framework





# Cosmological Inverse Problem

Compute meets Data:  
New Computation  
Model?

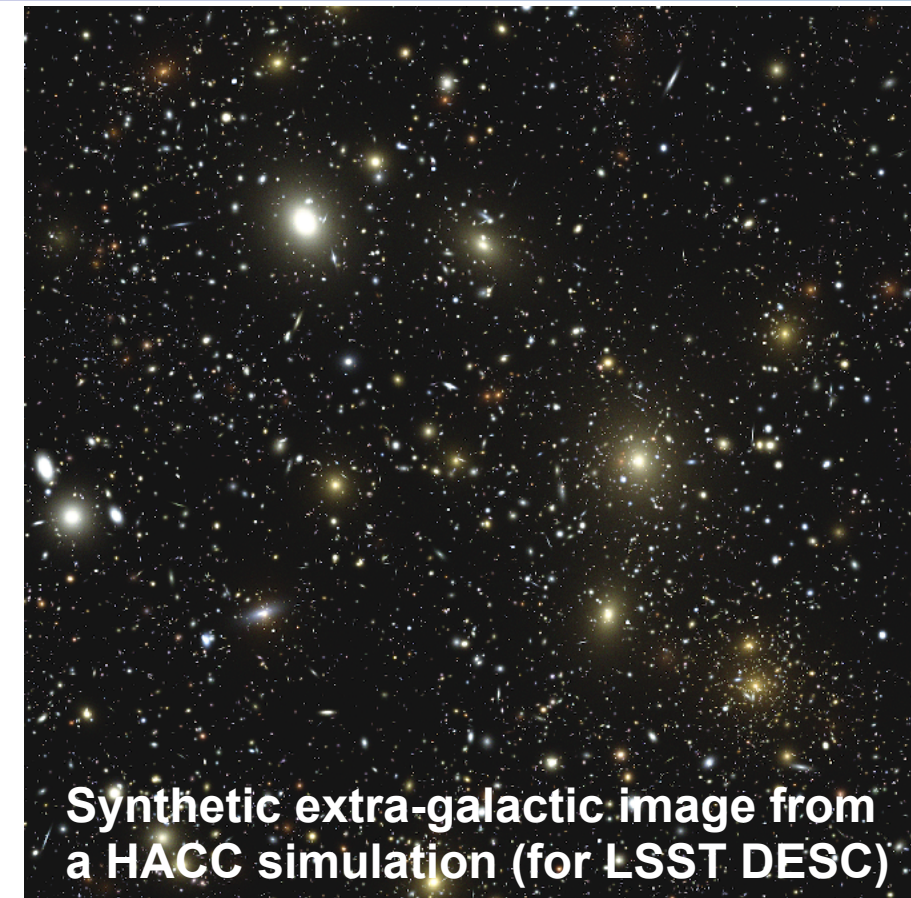




# Science Drivers for Future HACC Development

- **Science Requirements:** Next-generation survey science synthetic catalogs; detailed modeling for cosmological probes and cross-correlations; large-scale systematics studies
  - Weak lensing (WL) shear
  - Galaxy clustering (LSS)
  - Multiple LSS X WL cross-correlations
  - Cluster cosmology (mass calibration)
  - Secondary CMB anisotropies and backgrounds
  - Multiple CMB X LSS cross-correlations

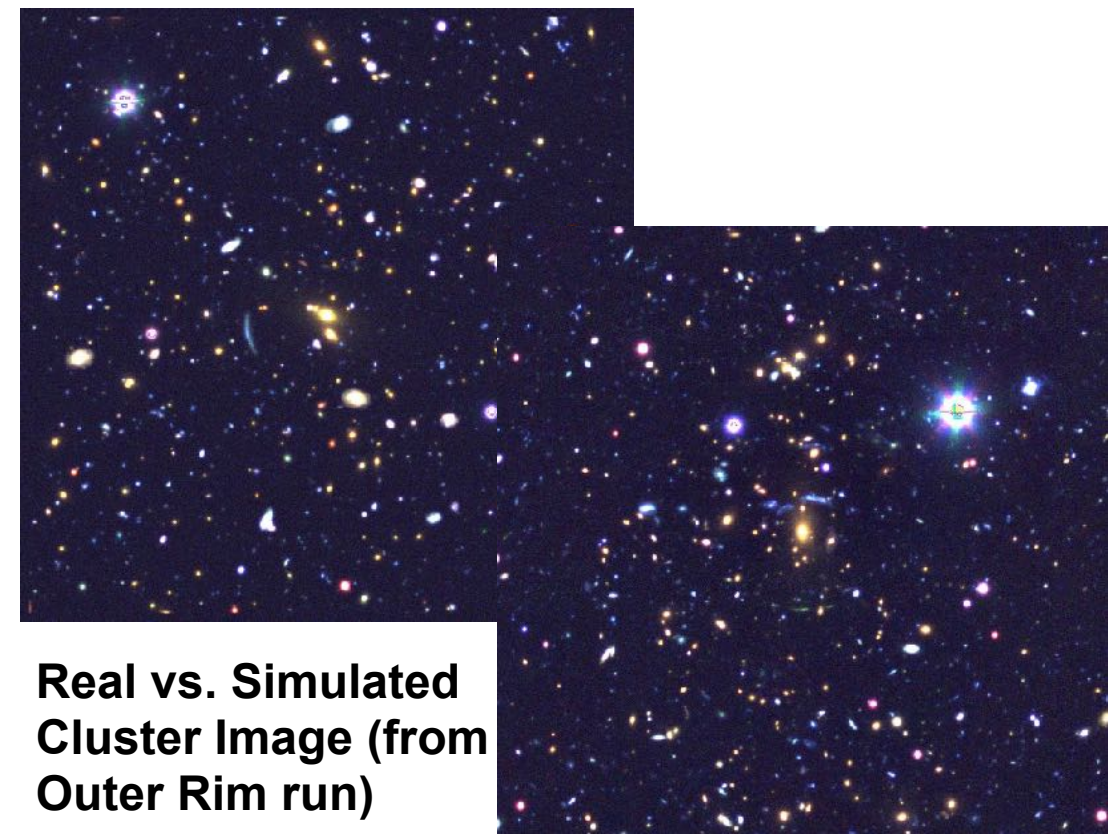
Many billions of objects, ~500 parameters each



Synthetic extra-galactic image from a HACC simulation (for LSST DESC)

**>1000 member collaborations breathing down our necks!**

LSST

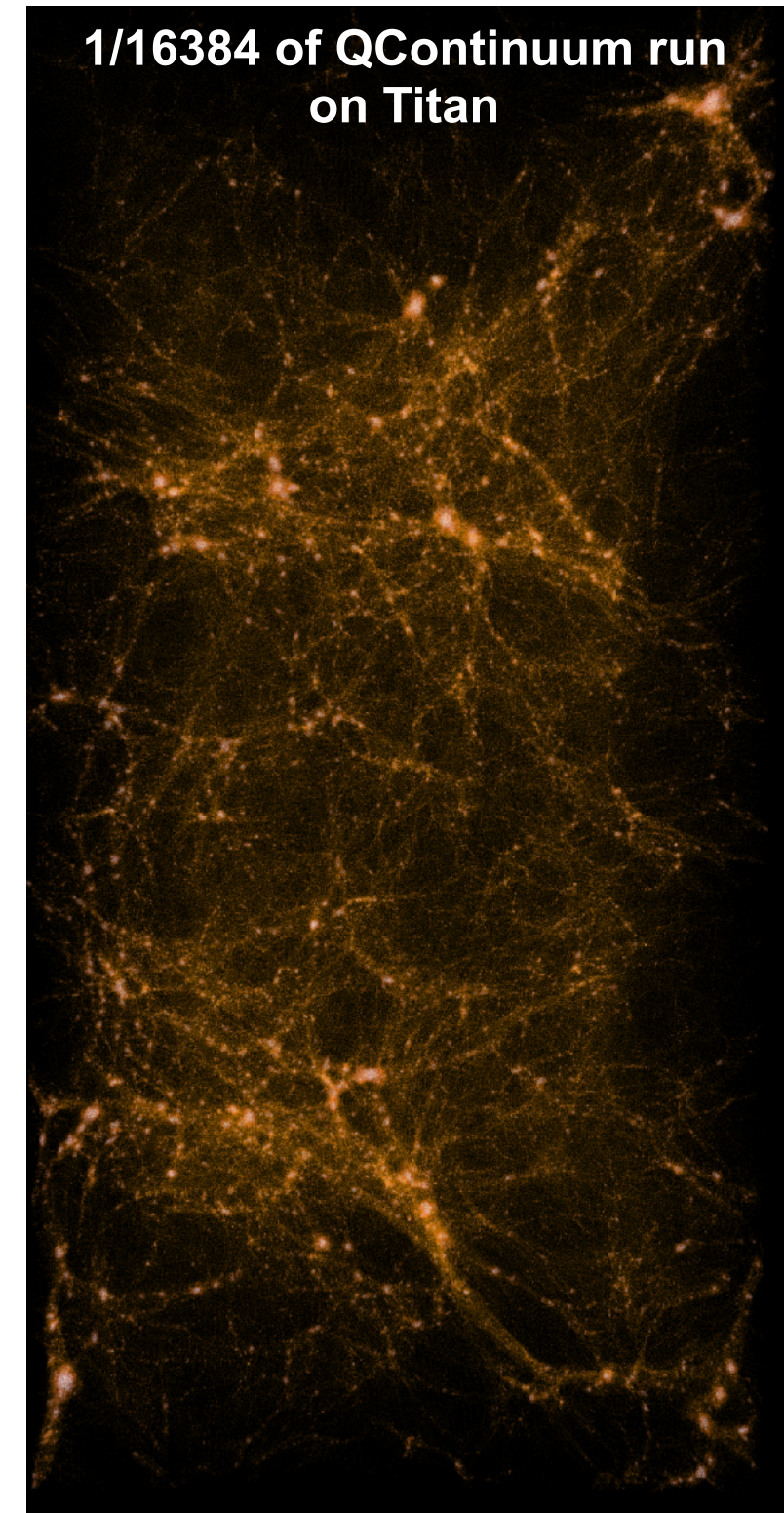


Real vs. Simulated Cluster Image (from Outer Rim run)



# HACC (Hardware/Hybrid Accelerated Cosmology Code)

- **HACC Physics and Problem Scale:** extreme-scale, particle-based (Lagrangian) framework for computational cosmology; solves the Vlasov-Poisson equation using particles, includes gas dynamics (new algorithm: CRK-SPH), with astrophysical feedback
- **HACC Design Priorities:** Frontiere et al., JCP 332, 160 (2017)
  - **Very high levels of performance** across multiple architectures — focus on *absolute*, not just *relative* performance, ~50%+ of peak
  - Be **fully scalable** (strong/weak scaling on the largest platforms)
  - **Performance portability:** uses multiple algorithms and implementations across architectures, *yet 95% of the code base remains unchanged*
  - Run on **pre-deployment systems** as a benchmark
- **Programming Model:** C++/MPI + X (X = OpenMP/CUDA/OpenCL/assembly)

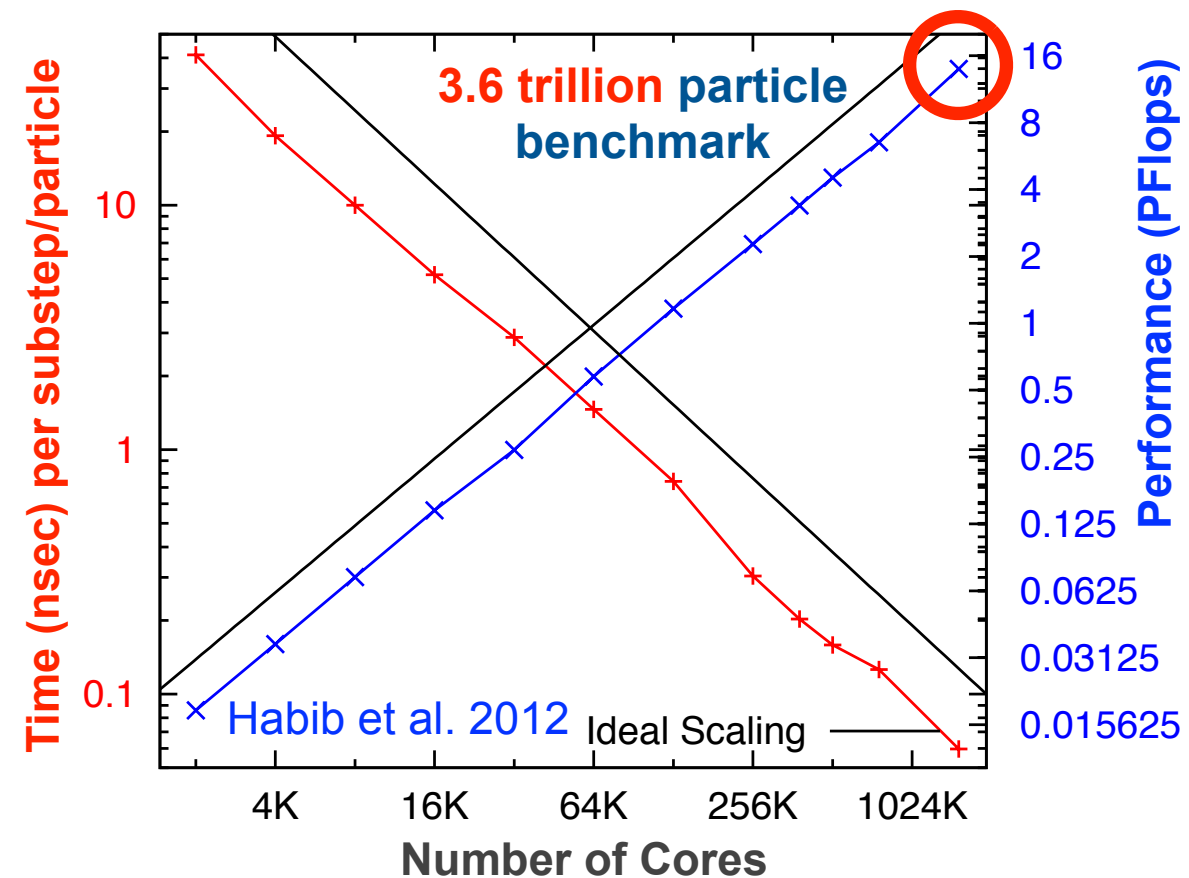


Habib et al., New Astron. 42, 49 (2016);  
Comm. ACM 60, 97 (2017) [Research Highlight]



# HACC: Algorithmic Features

- **Philosophy:** Smooth physics (large scale) — grids (architecture invariant); small-scale “rough” physics — particles (architecture-tuned)
- **Gravity — Hybrid Grid/Particle:** 6-th order spectral Poisson solver; 4-th order super-Lanczos spectral derivatives; short-range forces via spectral filters (high-accuracy polynomial fits), custom parallel 3D FFT
- **Gasdynamics — CRK-SPH:** Higher-order SPH scheme solves known SPH issues in dealing with mixing, tracking instabilities, etc.
- **Flexible Chaining Mesh and Local Trees:** Data structures optimize local force solvers (tree/fast multipole/P3M); neighbor list computation
- **Adaptive (Symplectic) Time-Stepping:** 2nd-order split-operator method; sub-cycling based on the RCB tree depth; implicit solver for subgrid models

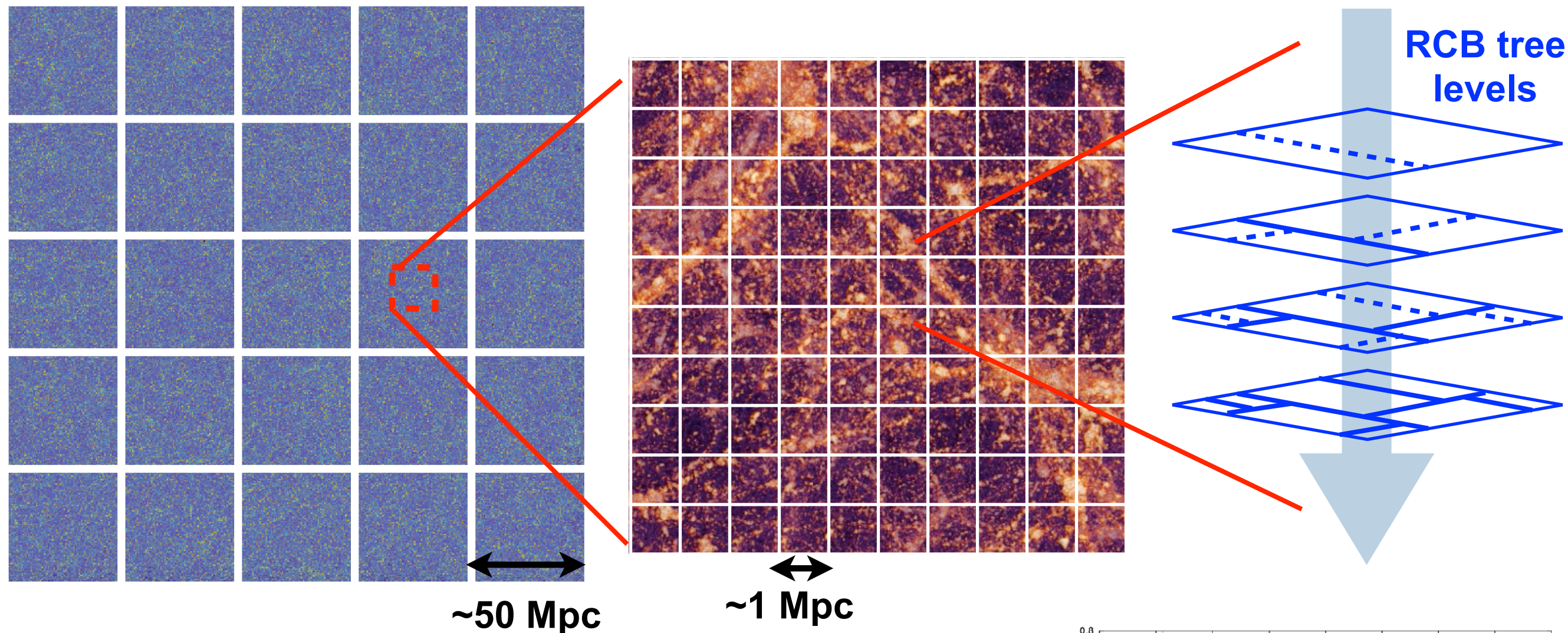


**HACC on Sequoia (2012): 13.94 PFlops, 69.2% peak, 90% parallel efficiency on 1,572,864 cores/MPI ranks, 6.3M-way concurrency**





# HACC In Pictures (“Million to One” Dynamic Range)

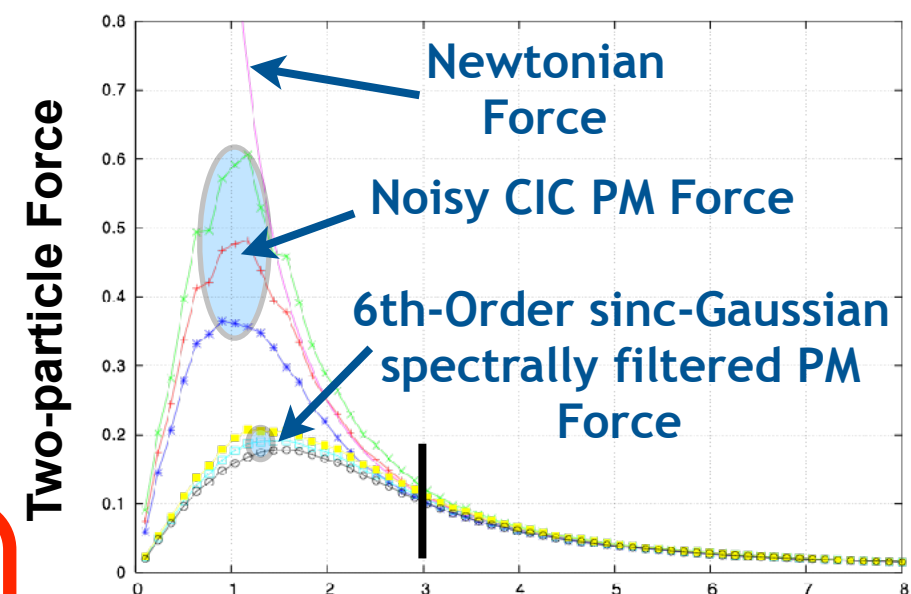


**HACC Top Layer:**  
3-D domain decomposition  
with particle replication at  
boundaries ('overloading')  
for Spectral PM algorithm  
(long-range force)

**Host-side**

**HACC 'Nodal' Layer:**  
Short-range solvers  
employing combination  
of flexible chaining mesh  
and RCB tree-based force  
evaluations

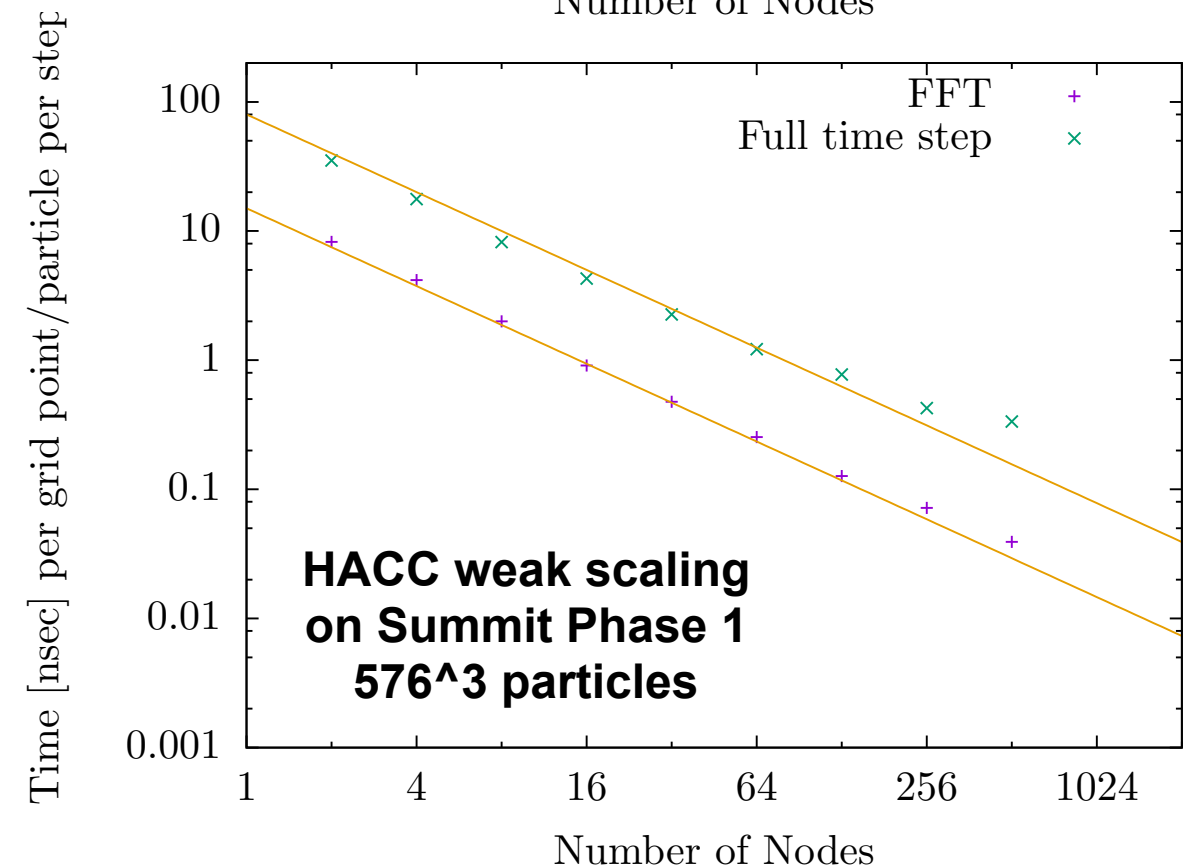
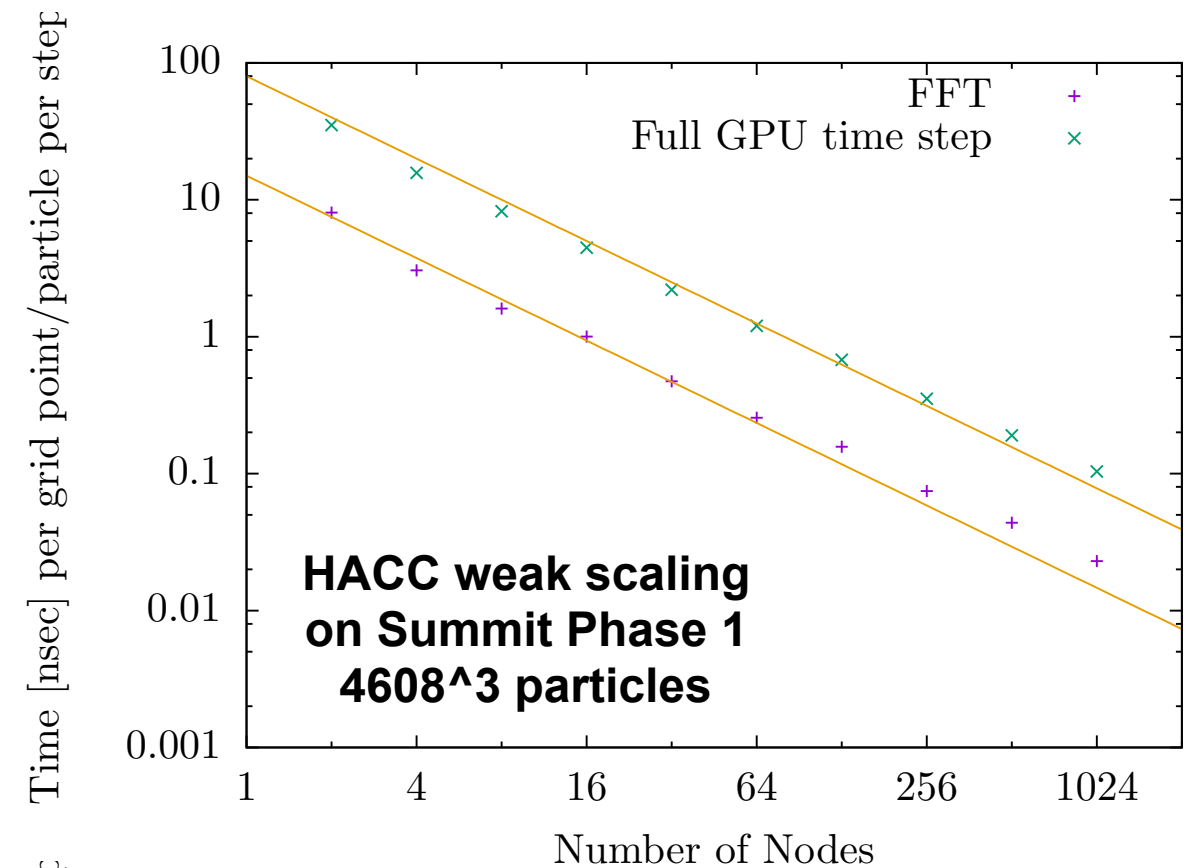
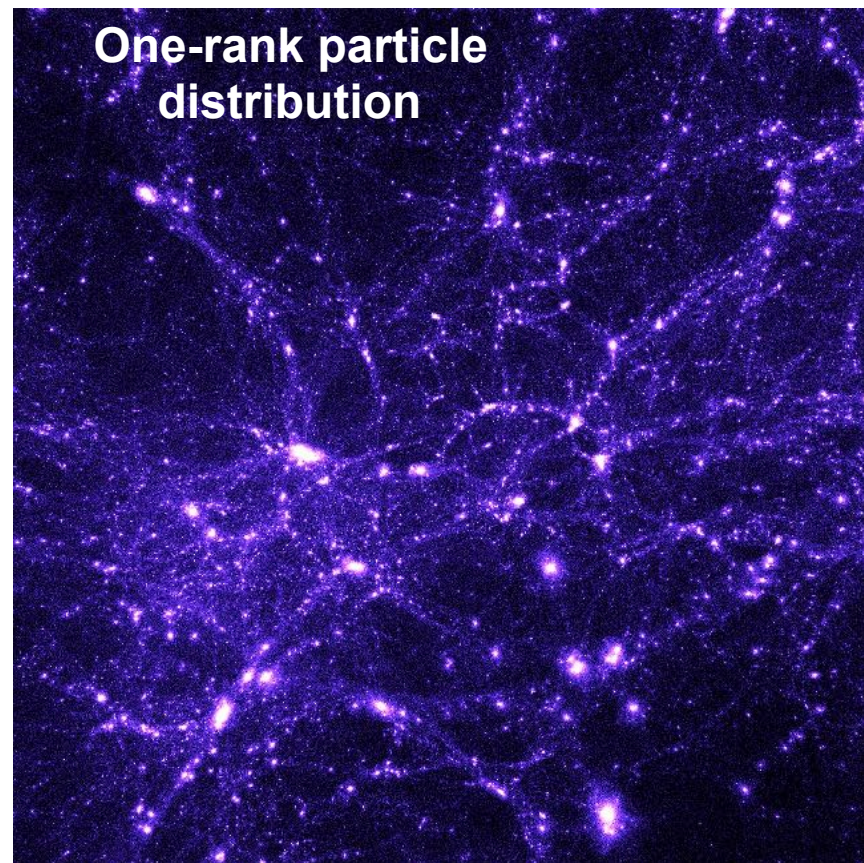
**GPU (compute-intensive):  
two options, P3M vs. TreePM**





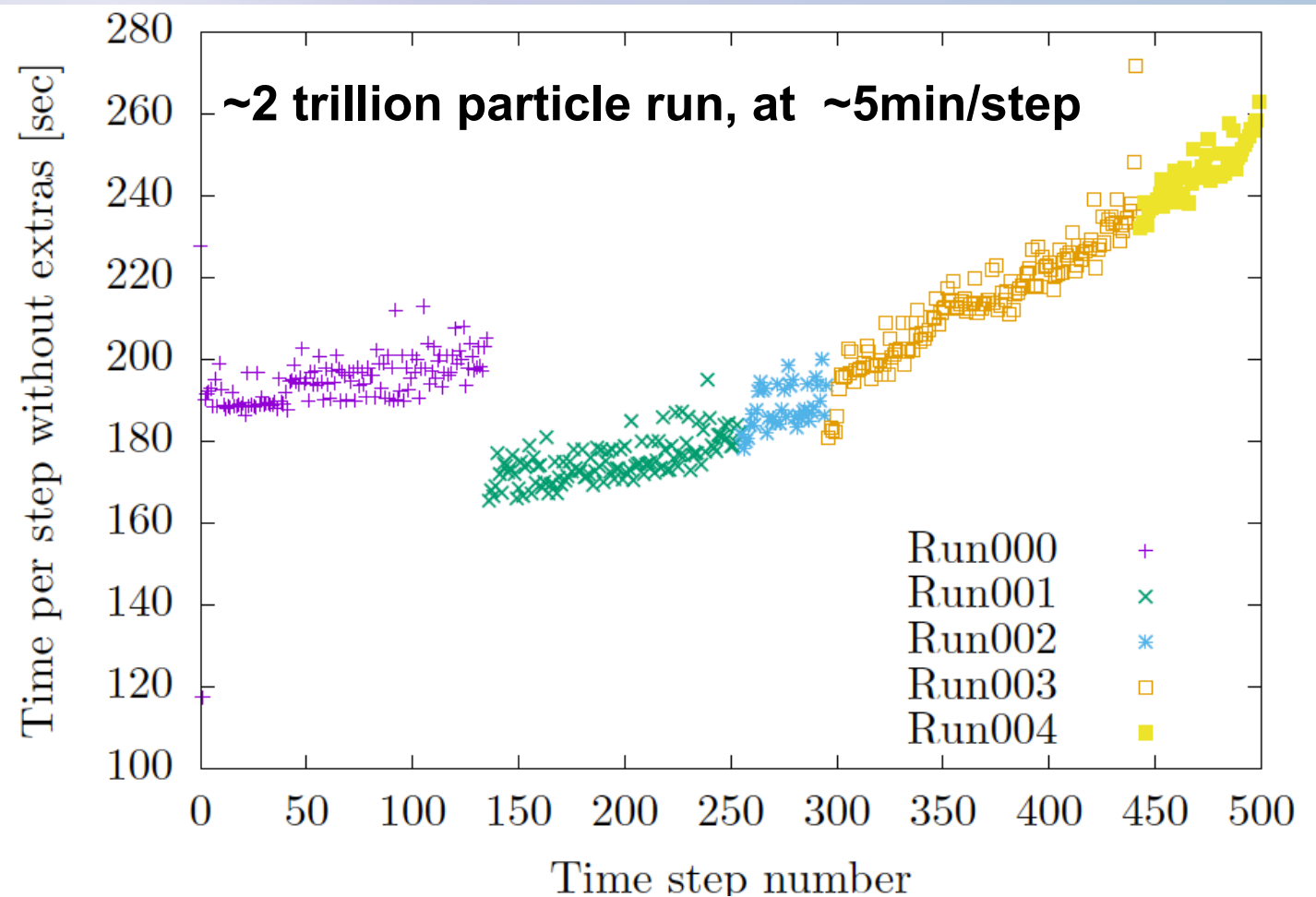
# HACC on Summit Phase 1/2

- **Transition from Titan:** In cosmological simulations, the computational intensity increases as a function of time due to increased particle clustering, this was a problem on Titan (and even worse on manycore systems)
- **Initial Runs on Summit Phase 1/2:** HACC ran on Summit within hours of the machine being available — detailed timing tests show expected weak and strong scaling results



# HACC on Summit I

- **Major Runs:** Carried out on Summit during acceptance period, 14 runs each set up for 24 hours, 9 finished cleanly; 3 of the world's largest cosmological simulations consumed roughly a week of machine time
- **Slow-Down Problem Solved:** Only ~30% slowdown as a function of time, with full timesteps taking only ~5 minutes!

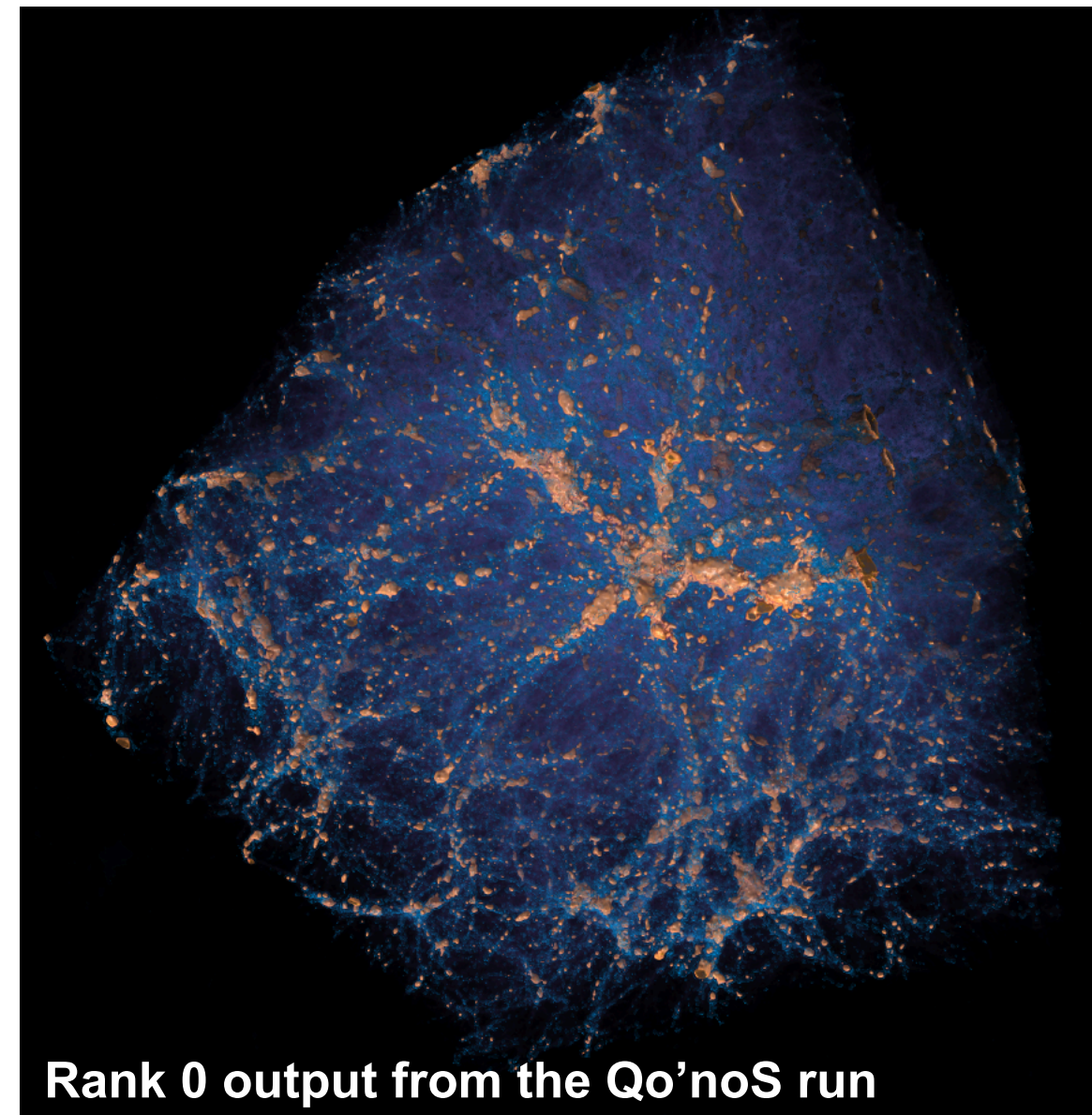


Simulation	Run	Job #	Exit	Error Message	Problem
Qo'noS	Run003a	229161	hang	Could not read jskill result from pmix server	halo finder particle exchange
Qo'noS	Run000	229198	clean	n/a	
Qo'noS	Run001	229290	clean	n/a	
Qo'noS	Run002	229467	crash	error 12	FFT
Qo'noS	Run003	229494	clean	n/a	
Qo'noS	Run004	229618	clean	n/a	
Vulcan	Run000	230003	hang	Could not read jskill result from pmix server	Halo finder i/o(?) after <i>Total halo particles</i>
Vulcan	Run001	230122	clean	n/a	
Vulcan	Run002	230178	clean	n/a	
Vulcan	Run003	230304	crash	Segmentation fault	after short range solver, no <i>Allocated heap</i> :
Vulcan	Run004	230337	clean	n/a	
Ferenginar	Run000	230380	clean	n/a	
Ferenginar	Run001	231468	crash	Segmentation fault	in halo center finder
Ferenginar	Run002	231911	crash	error 12	in halo center finder
Ferenginar	Run003	232210	clean	n/a	



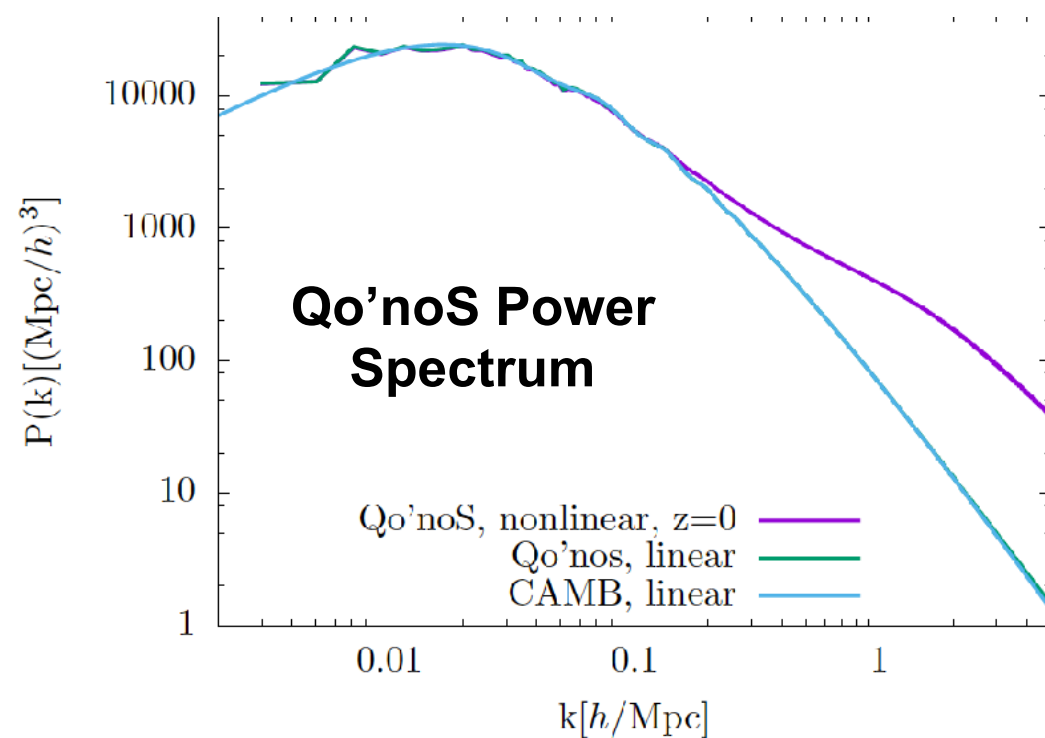
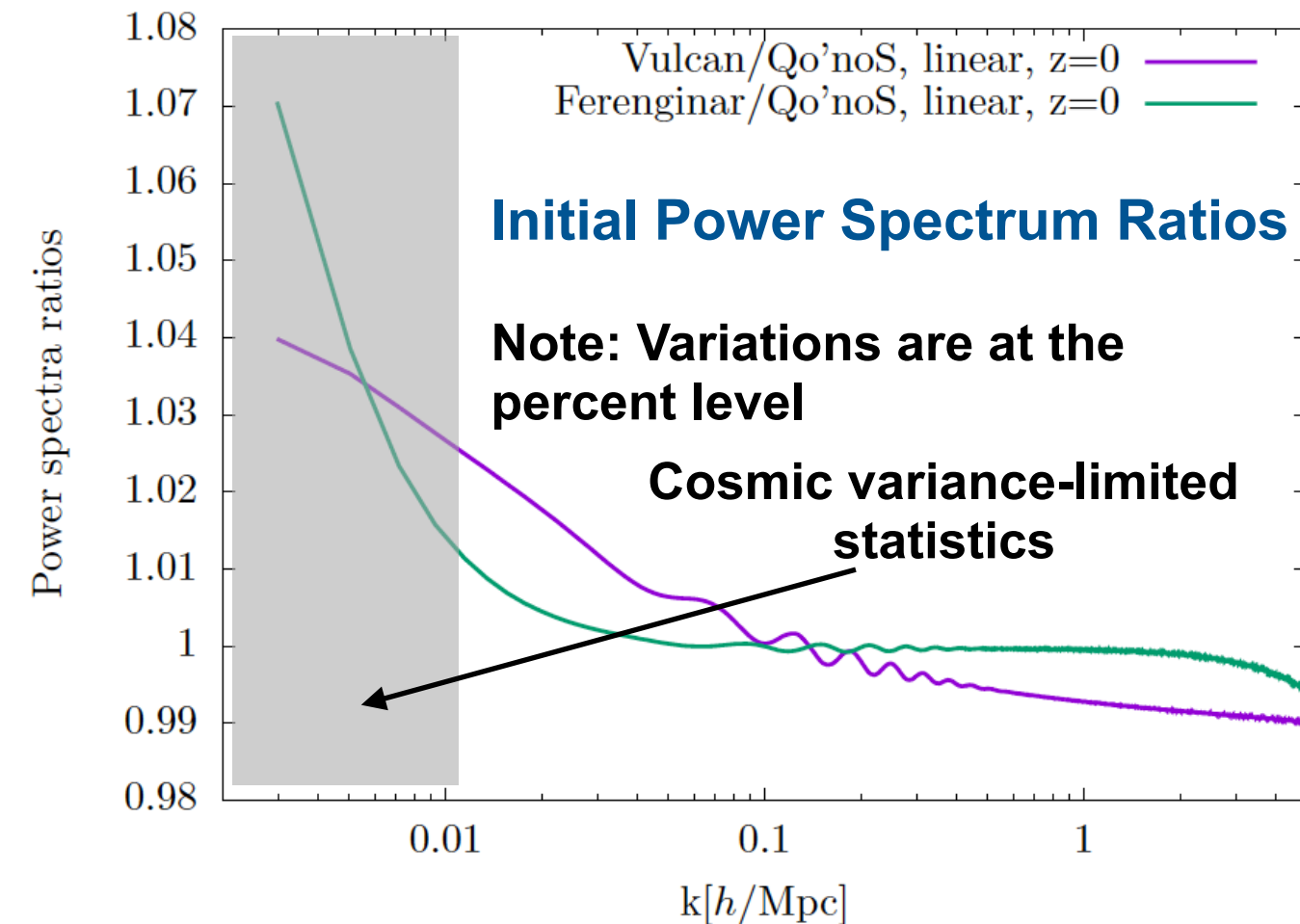
# HACC on Summit II

- **Simulation Specs:** Largest simulations at a mass resolution of  $10^9 M_{\text{sun}}$ 
  - Spatial dynamic range: million to one (3Gpc box,  $\sim 3\text{kpc}$  force resolution)
  - $\sim 2$  trillion particles
  - 4096 Summit nodes
  - 3 cosmologies to distinguish subtle effects
  - **Qo'noS:** best-fit Planck LCDM cosmology
  - **Ferenginar:** early dark energy model + Planck
  - **Vulcan:** small massive neutrino component ( $0.1\text{eV}$  mass) + Planck
  - Large analysis suite for multiple cosmological probes: weak/strong gravitational lensing, galaxy clustering, galaxy clusters, —
  - Total data generated  $\sim 9\text{PB}$  (should keep analysis teams busy for years)



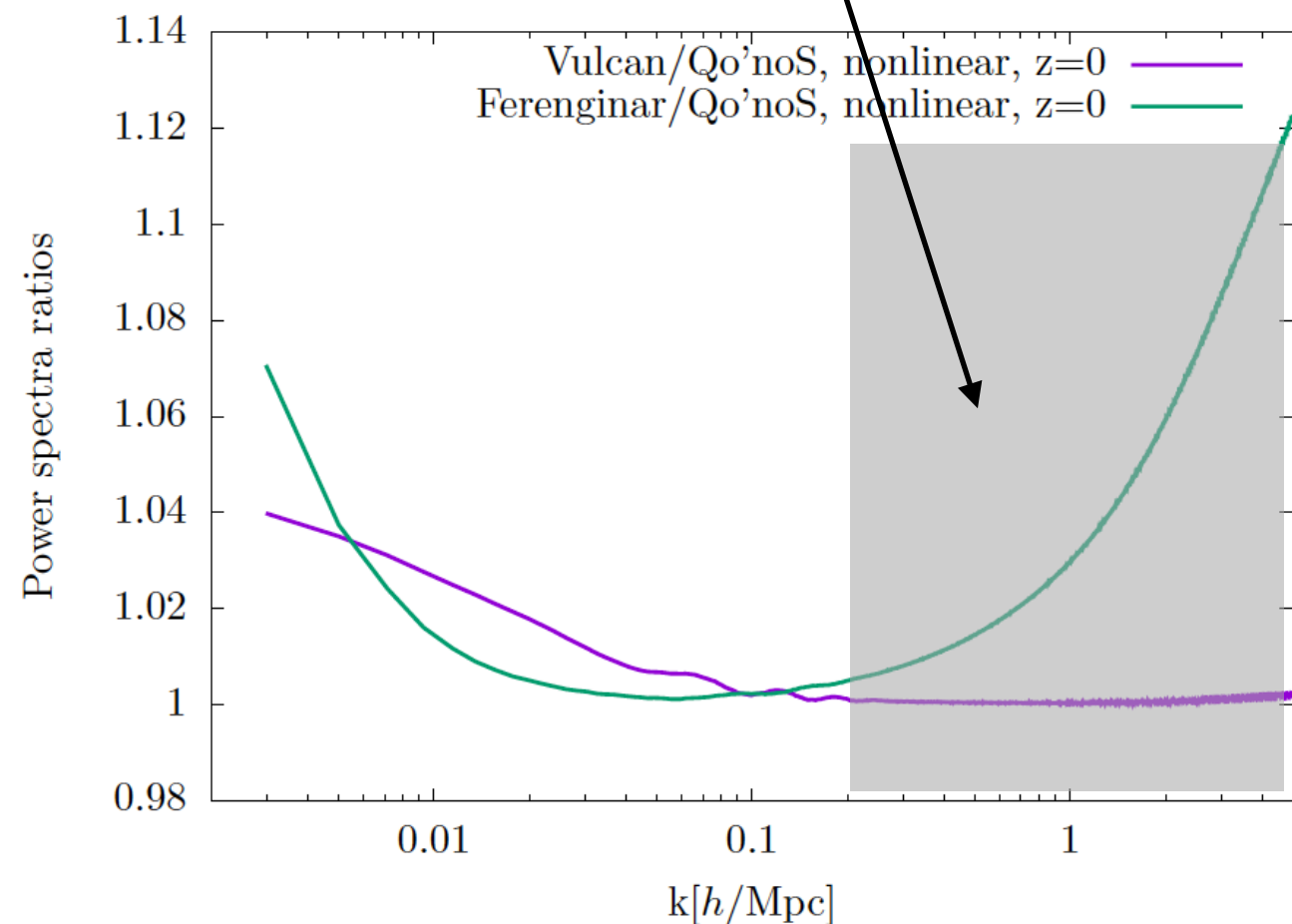


# HACC on Summit III



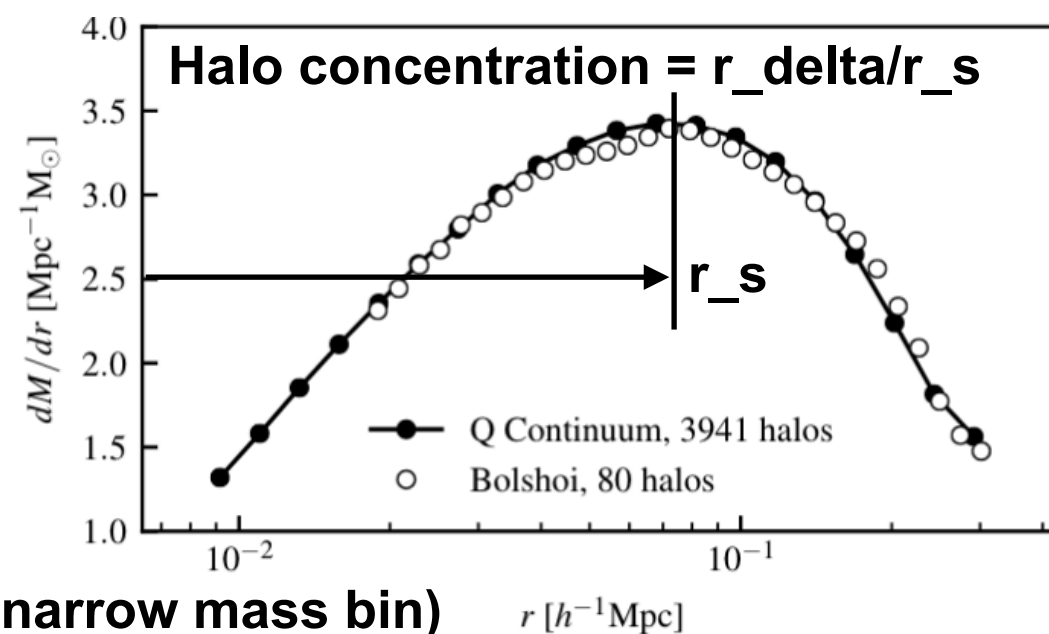
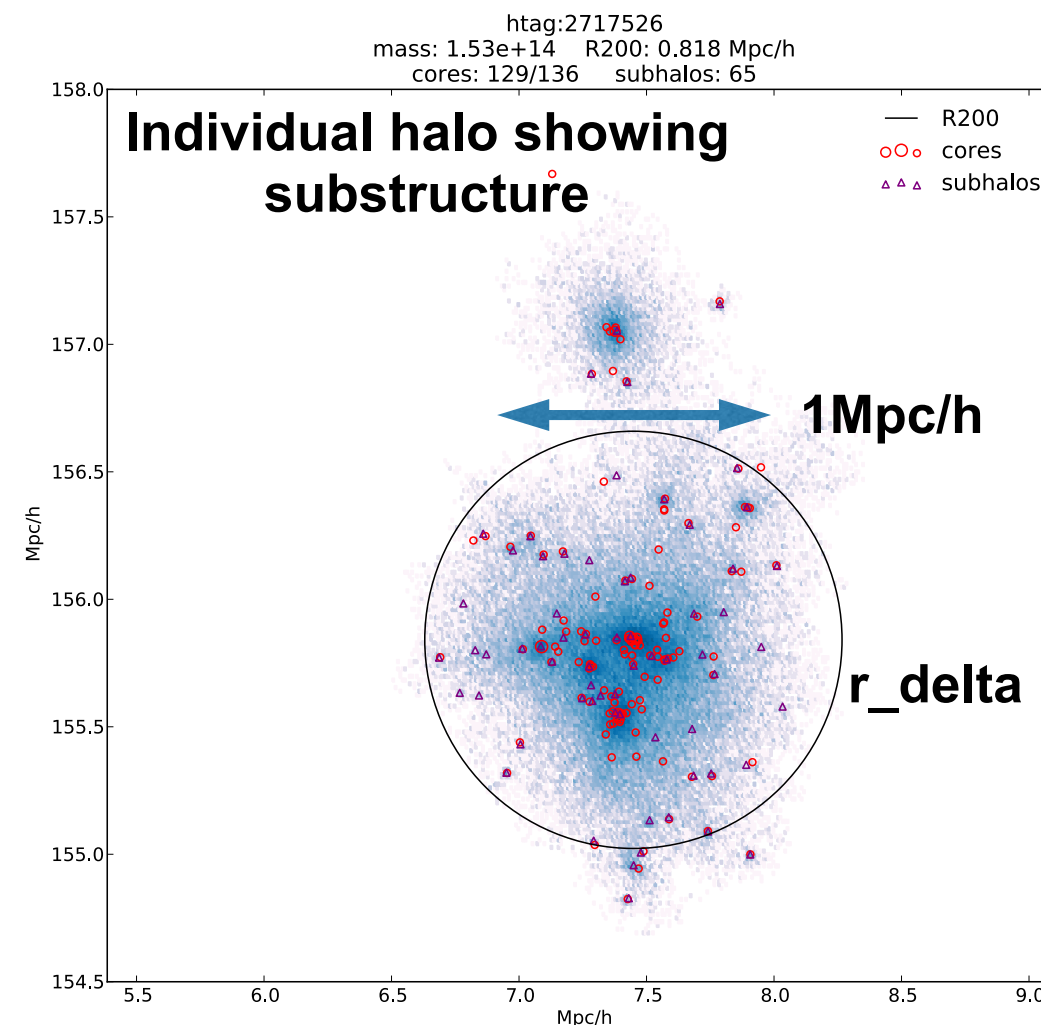
## Final Power Spectrum Ratios

Nonlinear scales can distinguish subtle cosmological effects, **these effects are large enough to measure with surveys**, but need to worry about 'baryonic effects'



# HACC on Summit IVa

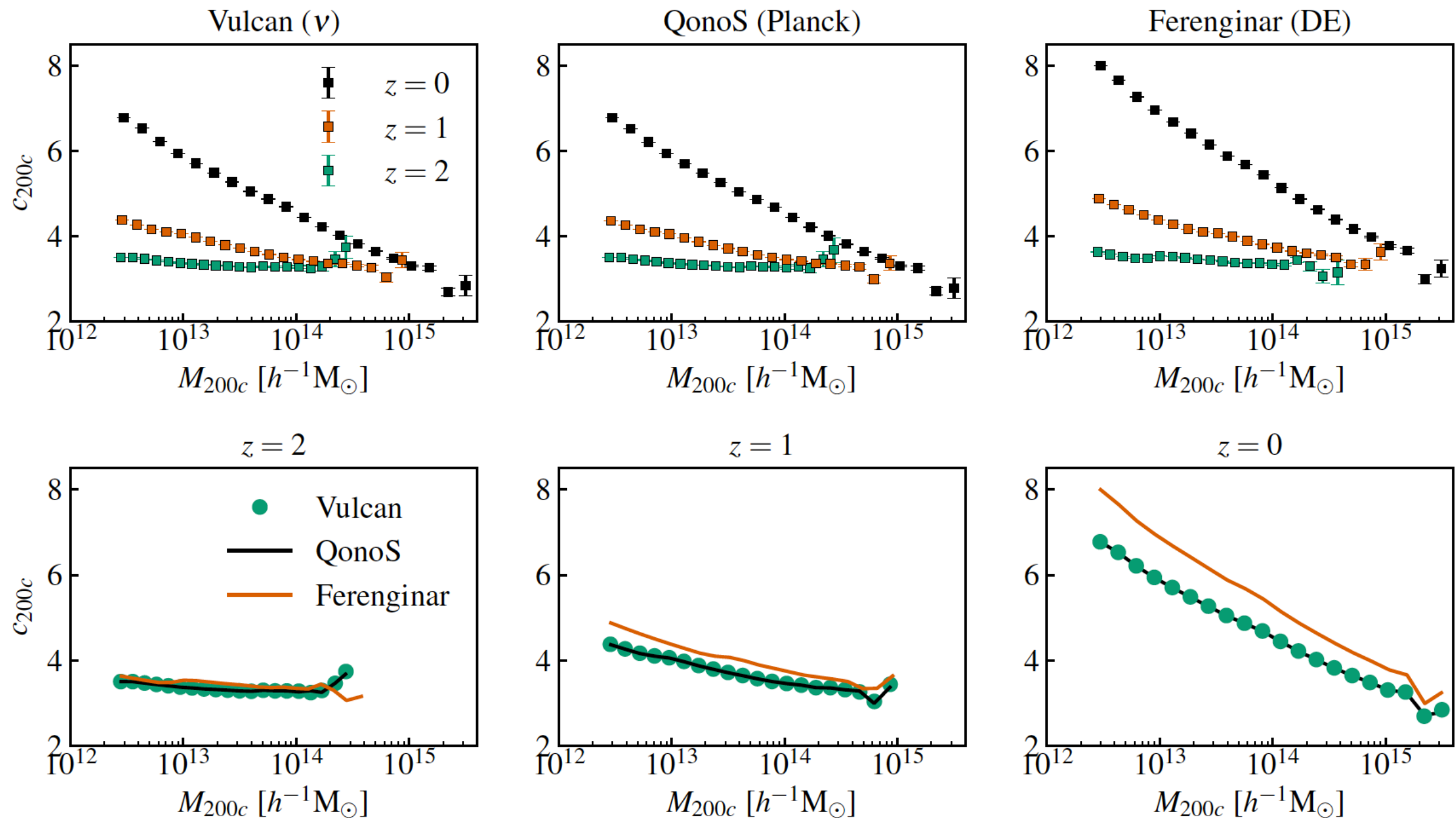
- **Halo Characterization:** Jeans instability in an expanding Universe eventually forms a complex “Cosmic Web” with dark matter clumps, termed “halos”, at the nodal points
- Cosmological significance of halos
  - Halos form hierarchically through mergers
  - Halo statistics are probes of the deeply nonlinear regime of structure formation
  - Galaxies form within halos
  - Galaxy properties are strongly correlated with those of their host halos and the halo’s dynamical history
  - The halo mass profiles can be directly measured (and also in cross-correlation)
  - Extreme-scale simulations resolve individual halos and allow for realistic statistical samples (billions of halos)



Halo profile (narrow mass bin)



# HACC on Summit IVb



High mass resolution and very large volumes yield excellent halo statistics, here shown using the **concentration-mass (c-M)** relation for the different cosmologies. Note that the early dark energy model leaves a clear imprint on the c-M relation, but massive neutrinos have almost no effect since they can't cluster at small scales.

# Summary

- **Ramifications:**

- In situ analysis became the bottleneck
- $12,288^3$  FFTs were fast enough but will be sped up ( $\sim 10$ secs/FFT)
- Excellent IO performance with HACC's GenericIO, few minutes per checkpoint without optimization
- On the fly lightcone generation for the future

- **What's Coming:**

- Cosmological hydrodynamics
- Optimizing CRK-HACC for Summit (successfully tested for scaling already)
- Working on a new set of subgrid models (gas cooling, UV heating, star formation, S<sub>n</sub> and AGN feedback, —)

